

DD2445 COMPLEXITY THEORY: LECTURE 14

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Last two lectures

Interlude about communication complexity
Extremely useful in many areas of TCS

Before the autumn break

Randomized computation

Probabilistic Turing machine (PTM)

Flips fair coin at each step

BPP Polynomial time; get answer right with probability $\geq 2/3$
(can be boosted to exponentially close to 1)

One-sided error

RP: No false positives — answer $x \in L$ always right

coRP: No false negatives — answer $x \notin L$ always right

"Zero-sided error"

ZPP Expected polynomial time
If terminates with answer, then always correct

$P \subseteq BPP \subseteq EXP$ [Believe $P=BPP$]

$BPP \subseteq P/poly$

boost success probability \Rightarrow
"golden" random string that always works \Rightarrow
use as advice

$BPP \subseteq \Sigma_2^P \cap \Pi_2^P$ ($\subseteq PH$) — didn't show

Complete problems?

1/2

Hierarchy theorems?

- seems hard; BPP semantic class

Randomized reductions

$L \leq_r L'$ if \exists poly-time PTM M s.t.
 $\forall x \in \{0,1\}^* \Pr[L'(M(x)) = L(x)] \geq 2/3$

If $L' \in \text{BPP}$ and $L \leq_r L'$ then
 $L \in \text{BPP}$

But randomized reductions are not
transitive

$$\boxed{\text{BP-NP}} = \{L \mid L \leq_r \text{3-SAT}\}$$

What is a PROOF?

I

Key insight: Something that is (computationally)
EASY TO CHECK

Other aspects:

- o Interactivity: Proof static, written object?
Or dialogue between prover
& verifier?
- o Correctness Always 100% correct?
Or OK with high probability?

Different combinations possible — yield
different results

Today: INTERACTIVE PROOFS

Example: F unsatisfiable CNF formula

- Static (NP-style) proof? Seems hard
- Interactive proof? YES, can be done
very efficiently

Interactive proofs important for:

- o cryptography (see a little bit next lecture)
- o hardness of approximation of NP-complete problems
- o indications of non-NP-completeness (hope to mention, but only briefly)

Set-up

II

Prover	all-powerful, but not trustworthy
Verifier	polynomial-time bounded but can flip coins (privately and hide from prover)

Send messages back and forth
Verifier computes message function f of

- input x ,
- randomness r ,
- previous messages

Prover computes message function g of

- input x
- previous messages

A k -ROUND INTERACTION is a sequence of message strings

$$\begin{aligned} a_1 &= f(x, r) \\ a_2 &= g(x, a_1) \\ a_3 &= f(x, r, a_1, a_2) \\ a_4 &= g(x, a_1, a_2, a_3) \\ &\vdots \end{aligned}$$

After k rounds verifier announces
output $\text{out}_{f, g}(x) =$

$$= f(x, r, a_1, a_2, \dots, a_k) \in \{0, 1\}$$

III

Output = $\begin{cases} 1 & \text{verifier believes } x \in L \\ 0 & \text{verifier does not believe } x \in L \end{cases}$

TRANSCRIPT = sequence of messages sent
random variable over r

DEF 1 (IP) input length / size

For $k = k(n)$, L is in $IP[k]$ if

\exists PTIME V poly-time (in input size $|x|$)
that can have k -round interaction with
prover $P: \{0, 1\}^* \rightarrow \{0, 1\}^*$ such that

COMPLETENESS

$x \in L \Rightarrow \exists P \Pr[\text{out}_V \langle V, P \rangle (x) = 1] \geq 2/3$

SOUNDNESS

$x \notin L \Rightarrow \forall P' \Pr[\text{out}_V \langle V, P' \rangle (x) = 1] \leq 1/3$

where all probabilities are over choice of
 V 's random string r

$$\boxed{IP} = \bigcup_{c \in \mathbb{N}} IP[n \leq c]$$

~~~~~  
Constants are again arbitrary

LEMMA 2 Can set completeness parameters  
to  $1 - 2^{-n^s}$  and soundness error parameters  
to  $2^{-n^s}$  for any constant  $s > 0$  without  
changing  $IP$ .



IV

Proof Boosting as in our error reduction for BPP.

PROP 3 The class of languages in IP decided by deterministic verifier is exactly NP.

Proof. Arora-Barak.

- Allowing proof to use randomness doesn't help. Can think of probabilistic proofs as random choice between deterministic proofs. If high success probability on average, then  $\exists$  some deterministic proof with high success probability
- Proof is in principle unbounded - can even solve undecidable problems. But can be shown that given verifier  $V$  it is possible to compute optimal proof for  $x$  using  $\text{poly}(|x|)$  space  
Decide probability of acceptance  $\Rightarrow$  shows whether  $x \in L$  or not.  
So  $IP \subseteq PSPACE$   
[More careful argument needed for a formal proof, of course]
- Possible to replace completeness  $2/3$  with exactly  $1$  (perfect completeness)  
[Nontrivial fact]



- o By contrast, reducing soundness <sup>(error)</sup> to exactly 0 makes verifier deterministic  $\Rightarrow$  collapse to NP
- o Randomness hidden from prover - called private coin interactive proofs. There are also public coin interactive proofs (will see soon)
- o In Lem 2, boost success probability by sequential repetition. Can also do parallel repetition by asking questions in parallel and run protocols in parallel. But then provers can correlate answers to improve chances. However, Prover's probability of winning still decreases quickly  
[Non-trivial - we will skip this]

EXAMPLE 4 Interactive proof for GRAPH NON ISOMORPHISM

Two graphs  $G_1$  &  $G_2$  ISOMORPHIC if  $\exists \pi: V(G_1) \rightarrow V(G_2)$  one-to-one and onto s.t.  $(u,v) \in E(G_1) \Leftrightarrow (\pi(u), \pi(v)) \in E(G_2)$

Notation  $G_1 \cong G_2$

$\{ \langle G_1, G_2 \rangle \mid G_1 \cong G_2 \}$



GRAPH ISOMORPHISM  $\in$  NP  
(certificate:  $\pi$ )

Can be solved in quasipolynomial time  
 $\exp(\log^{O(1)} n)$  [Babai '16]

Even before that was not believed to  
be NP-complete (unless PH collapses)

Important component in proof of this:

Interactive proof for GRAPH NON-ISOMORPHISM  
(GNI for short)

Protocol for GNI

V: Pick  $i \in_R \{1, 2\}$

$$V(G) = [n]$$

Pick random permutation  $\pi^* : [n] \rightarrow [n]$

Apply  $\pi^*$  to  $G_i$  to get graph  $H$   
with  $V(H) = [n]$

$$E(H) = \{(\pi^*(u), \pi^*(v)) \mid (u, v) \in E(G_i)\}$$

Send  $H$  to  $P$

$P$ : Respond with  $j \in \{1, 2\}$

$V$ : Accept if  $i=j$ ; reject otherwise

Analysis

$G_1 \not\cong G_2$ : Then all-powerful prover can  
find  $j$  for which  $H \cong G_j$  and respond  
with correct answer



$G_1 \cong G_2$  In this case Prover just sees a random permutation of the same graph. Information-theoretically impossible to tell the difference.

For every graph  $H$  Prover has fixed answer  
But  $H$  equally likely for  $i=1$  and  $i=2$   
So Prover correct with probability =  $1/2$

Repeat protocol twice to get  $1/4 < 1/3$



Interesting aspect: What does verifier learn?

learns whether  $G_1 \cong G_2$  or not  
learns nothing beyond this fact

ZERO-KNOWLEDGE PROOFS (Kunskaplösa bevis)

What does it mean to "learn nothing"?!?

Show that verifier can produce same kind of transcript (with correct probability distribution) in polynomial time without prover

So if this conversation was helpful for something else, then verifier could have talked to him-/herself...

Useful in cryptography:

Ex Prove you know your password without revealing it.  
More about this in a lecture or two...



# Public coins

What if prover sees coin flips?  
 Then verifier need only send coin flips  
 - prover can compute questions him-/herself

## DEF 5 Arthur - Merlin protocols

$AM[k] = IP[k]$  except

- o verifier only sends random bits
- o can't use any other randomness

Arthur = king  
 Merlin = court magician

Merlin - Arthur protocols; Merlin goes first  
 sometimes notation

$AM, AMA, AMAM$  depending on # rounds

$M$ : This is just NP

$A$ : This is just BPP

$AM = BP \cdot NP$  [requires some thinking]

$MA$  interesting, important class

Standard notation  $AM = AM[2]$

As before, verifier = Arthur announces decision in the end

$AM[2k]$  = deterministic decision based on transcript

$AM[2k+1]$  = randomized computation to reach decision



Some facts (that we won't prove)

IX

LEMMA 6  $\forall k, k \text{ constant}, AM[k] = AM[2]$

THEOREM 7 [Goldwasser, Sipser '87]

For every  $k = k(n)$  computable in time  $\text{poly}(n)$   
it holds that

$$IP[k] \subseteq AM[k+2]$$

So having private coins not really that important!

Can show  $GN1 \in AM[2]$ , which in turn indicates (already before [Barak '16]) that GRAPH ISOMORPHISM unlikely to be NP-complete

[Read sec 8.2 in Arora-Barak if interested - we are not able to cover this in class]

We've argued  $NP \stackrel{(1)}{\subseteq} IP \stackrel{(2)}{\subseteq} PSPACE$

(1) Probably strict - what about (2)?

What does interaction buy you? Nothing;  $IP$  with deterministic verifier  $= NP$

What does randomness buy you? Probably nothing; believe  $P = BPP$

So what does interaction + randomness buy you?  
Not too much, right? **WRONG!**



THEOREM 8 [Lund, Fortnow, Karloff, Nisan '90] X  
[Shamir '90]

$$IP = PSPACE$$

$IP \subseteq PSPACE$  not hard, as handwaved before  
For  $PSPACE \subseteq IP$ , consider  $PSPACE$ -complete language TQBF and show  $TQBF \in IP$ .

We'll prove something weaker than conveys the main ideas

THEOREM 9  $coNP \subseteq IP$

Want protocol for

$$\overline{3\text{-SAT}} = \{ \varphi \mid \varphi \text{ unsatisfiable 3-CNF} \}$$

Design more general protocol for proving number of satisfying assignments

$$\#SAT_D = \{ \langle \varphi, K \rangle \mid \varphi \text{ 3-CNF with exactly } K \text{ satisfying assignments} \}$$

Note that  $K=0$  gives  $\overline{3\text{-SAT}}$  as special case

Key trick: ARITHMETIZATION of CNF formula

Fix some suitable finite field  $\mathbb{F}$  (e.g., computing modulo some prime  $p$ )

$1 = \text{truth}$  = multiplicative identity of  $\mathbb{F}$

$0 = \text{falsity}$  = additive identity



$$\neg x_i = \bar{x}_i \quad \text{true iff} \quad 1 - x_i = 1$$

$$x_i \wedge x_j \quad \text{true iff} \quad x_i \cdot x_j = 1$$

$$x_i \vee x_j \quad \text{true iff} \quad 1 - (1 - x_i)(1 - x_j) = 1$$

Rewrite every 3-clause

$$C_j = x_i \vee \bar{x}_j \vee x_k$$

as degree-3 polynomial

$$p_j(x_1, \dots, x_n) = 1 - (1 - x_i)x_j(1 - x_k)$$

Evaluates to 1 over 0/1-assignments iff clause true.

Represent  $\varphi = \bigwedge_{j=1}^m C_j$  as

$$P_\varphi = \prod_{j=1}^m p_j(x_1, \dots, x_n) \quad (*)$$

Degree  $\leq 3m$

$P_\varphi$  has efficient representation in size  $O(m)$

$\alpha$  satisfying assignment to  $\varphi \Rightarrow P_\varphi(\alpha) = 1$

$\alpha$  falsifying  $\varphi \Rightarrow P_\varphi(\alpha) = 0$

Hence, # satisfying assignments is

$$K = \sum_{b_1 \in \{0,1\}} \dots \sum_{b_n \in \{0,1\}} P_\varphi(b_1, \dots, b_n) \quad (**)$$

Do calculations in  $(**)$  modulo some prime  $p > 2^n \geq K$  so that answer mod  $p$  correct



High-level ideaInput:  $\langle \varphi, K \rangle$ Prover sends prime  $p \in (2^n, 2^{2n}]$ Verifier checks that  $p$  indeed prime  
(can be done in poly time)

Then run protocol to check

$$K = \sum_{b_1 \in \{0,1\}} \dots \sum_{b_n \in \{0,1\}} g(b_1, \dots, b_n) \quad (+)$$

for polynomial  $g$  with efficient representation  
so that it can be evaluated in poly time  
(holds for  $g = P_\varphi$ )

Observation If we plug in  $x_i = b_i$  for  $i=2, \dots, n$ ,  
then  $g(x_1, b_2, \dots, b_n)$  is univariate poly,  
and so is

$$h(x_1) = \sum_{b_2 \in \{0,1\}} \dots \sum_{b_n \in \{0,1\}} g(x_1, b_2, \dots, b_n) \quad (\neq)$$

The equality (+) holds iff  $h(0) + h(1) = K$

So verifier can

- (i) ask prover for  $h(x_i)$
- (ii) check  $h(0) + h(1) = K$
- (iii) check that prover didn't cheat with  $h$ .

Design protocol  $\text{SUMCHECK}(g, K, n)$  to  
check that  $n$ -variate polynomial  $g$   
satisfies (+)



# SUMCHECK ( $g, K, n$ )

XIII

V: If  $n = 1$  accept if  $g(0) + g(1) = K$ , otherwise reject.

If  $n \geq 2$ , ask prover to send (efficient representation of)  $h(x_1)$  in  $(\mathbb{F})$   
*easy;  $h$  univariate polynomial*

P: Reply with  $s(x_1)$

V: Check if  $s(0) + s(1) = K$  and reject o/w

Pick random  $a \in [0, p-1]$

Let  $K' = s(a)$

Let  $g' = g(a, x_2, \dots, x_n)$

Run SUMCHECK( $g', K', n-1$ )

Recursive call to protocol checks that prover wasn't cheating but answered  $s(x_1) = h(x_1)$  by verifying

$$s(a) = \sum_{b_2 \in \{0,1\}} \dots \sum_{b_n \in \{0,1\}} g(a, b_2, \dots, b_n)$$

But note that  $a$  is not  $\in \{0,1\}$  but an arbitrary number in  $[0, p-1]$  !



LEMMA 10

The protocol SUMCHECK  $(g, K, n)$  when run on a degree- $d$  polynomial and computing modulo prime  $p$  has

- completeness  $\frac{1}{2}$
- soundness error  $\leq dn/p$



In our case

$\varphi$  has  $m$  clauses  $\Rightarrow P_{\varphi}$  degree  $\leq 3m$

$m$  clauses over  $n$  variables  $\Rightarrow$

$$m \leq \binom{n}{3} 3^3 \leq 27n^3 \text{ [why?]}$$

Pick  $p > 2^n$

Get soundness error  $\leq$

$$\frac{dn}{p} < \frac{81n^4}{2^n} \rightarrow 0 \text{ as } n \rightarrow \infty$$

So we just need to prove Lemma 10.

This will have to wait till next lecture...